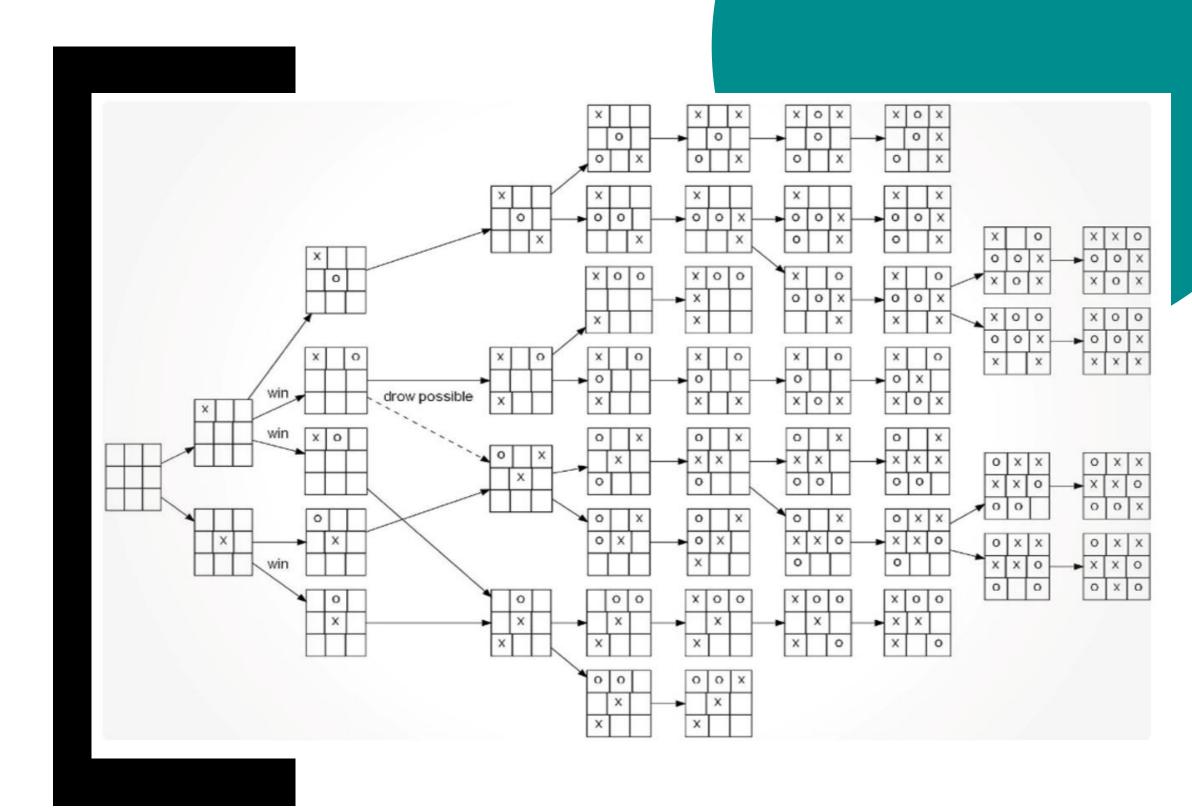


# КРЕСТИКИ НОЛИКИ

ФАЛЬКОВ КОНСТАНТИН ПМ-2101



#### Ο ΠΡΟΕΚΤΕ



#### ПОПЫТКИ

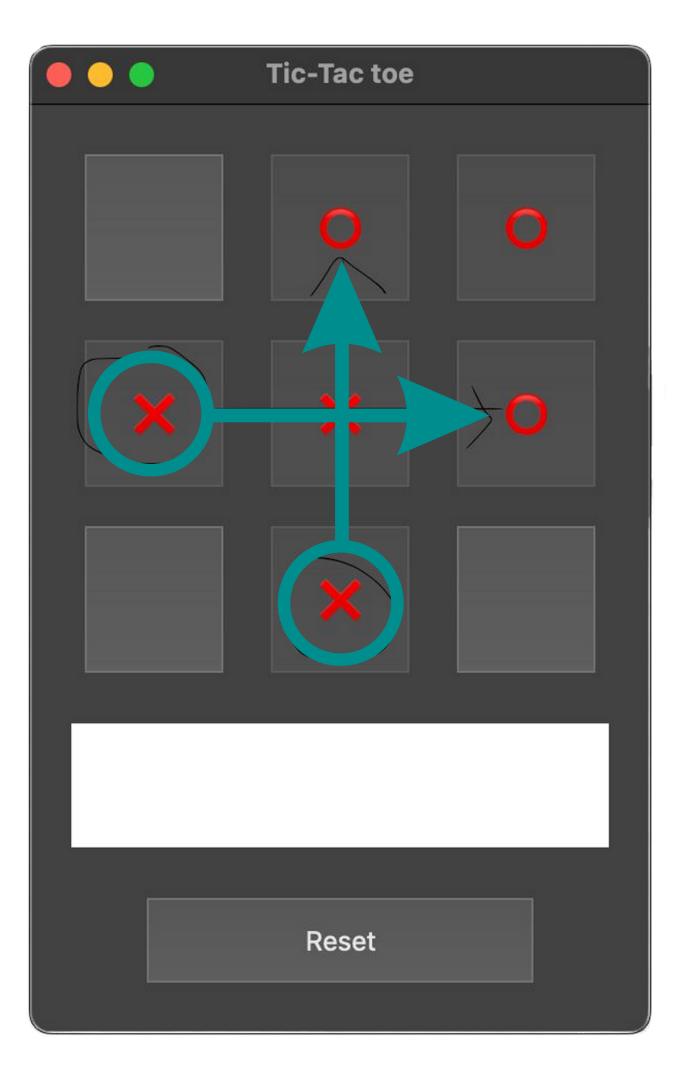
#### НЕУДАЧНАЯ ПОПЫТКА ПРОСЧИТАТЬ ВСЕ КОМБИНАЦИИ

```
# if step1 == 2:
                 self.field_buttons[0][2].click()
                 # [0 0 o]
                  # [0 x 0]
                  # [0 0 0]
                 flag = 0
                 if self.field[0][0] == 1 and flag != 1:
                      self.field buttons[2][2].click()
                 if self.field[0][1] == 1:
                      self.field_buttons[1][2].click()
                 if self.field[0][2] == 1:
                      self.field buttons[0][2].click()
                 if self.field[1][2] == 1:
                      self.field_buttons[0][1].click()
                 if self.field[2][0] == 1:
                      self.field_buttons[2][0].click()
                 if self.field[2][1] == 1:
                      self.field_buttons[1][0].click()
                 if self.field[2][2] == 1 and flag != 1:
                      self.field_buttons[0][0].click()
                  if self.field[1][0] == 1:
                      self.field_buttons[2][1].click()
                  if self.field[0][2] == 1:
                      delicateStep = random.randrange(0, 2)
                     if delicateStep == 1:
                          flag = 1
                          self.field_buttons[2][2].click()
                     else:
                          flag = 1
                          self.field buttons[0][0].click()
```

#### ПЕРВЫЕ УСПЕХИ

```
if self.turn % 2 + 1 == 2:
    self.field[x][y] = -1
    else:
    self.field[x][y] = 1
```

# ПЕРВАЯ КОМБИНАЦИЯ



### REINFORECMENT LEARNING

```
tic_tac_toe.py × to_fit_agents.py × to_policy_p1.json
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                                                                                                                                                                                                               Hide notification Don't show aga
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```

```
def checkWinner(self):
   Функця определяет победителя в игре
   :return: 1 - победили крестики, -1 - нолики, 0 -ничья
   # Смотрим по строкам
   for i in range(3):
       row_sum = sum(self.field[i])
       if row_sum == 3:
           self.isEnd = True
           return 1
       if row_sum == -3:
            self.isEnd = True
           return -1
   # Смотрим по столбцам
   for i in range(3):
       col_sum = sum([self.field[k][i] for k in range(3)])
       if col_sum == 3:
           self.isEnd = True
           return 1
       if col sum == -3:
            self.isEnd = True
           return -1
   # Смотрим по диагоналям
   diag_sum1 = sum([self.field[i][i] for i in range(3)])
   diag_sum2 = sum([self.field[i][3 - i - 1] for i in range(3)])
   diag_sum = max(abs(diag_sum1), abs(diag_sum2))
   if diag_sum == 3:
       self.isEnd = True
       if diag_sum1 == 3 or diag_sum2 == 3:
           return 1
       else:
            return -1
   if len(getAvailablePositions(self.field)) == 0:
```

ФУНКЦИЯ
ПРОВЕРКИ
ПОБЕДИТЕЛЯ

ПОИСК
НЕЗАНЯТЫХ
ПОЛЕЙ

```
lef getHash(field):
    11 11 11
   Создаёт хэш состояния игры
   :return: строка из массива
   11 11 11
   state = []
   for row in field:
        for cell in row:
            state.append(cell)
   return str(state)
```

СОХРАНЯЕМ СОСТОЯНИЕ ИГРЫ

```
def giveReward(self):
    Раздать агентам награду после игры
    11 11 11
    result = self.checkWinner()
    if result == 1:
        self.tic_player.feedReward(1)
        self.tac_player.feedReward(0)
    elif result == -1:
        self.tic_player.feedReward(0)
        self.tac_player.feedReward(1)
    else:
        self.tic_player.feedReward(0.1)
        self.tac_player.feedReward(0.5)
```

ПООЩРЕНИЕ ИГРОКА ПОЛУЧАЕМ ВОЗМОЖНЫЕ ПОЗИЦИИ, СОСТОЯНИЕ ДОСКИ И ЧЬЯ ОЧЕРЕДЬ ДЛЯ ХОДА

С ВЕРОЯТНОСТЬЮ 30% СЛЕДУЮЩИХ ХОД РАНДОМНЫЙ

ПОЛУЧАЕМ VALUE ПООЩРЕНИЯ ДЛЯ СЛЕДУЮЩИХ ХОДОВ, ДЕЛАЕМ НОВУЮ ДОСКУ,ХЭШИРУЕМ ЕЕ И СРАВНИВАЕМ РЕЗУЛТАТЫ ОТ ХОДОВ -> ИЩЕМ МАКСИМАЛЬНОЕ ЗНАЧЕНИЕ И СОХРАНЯЕМ НУЖНОЕ ДЕЙСТВИЕ

```
def chooseAction(self, positions, current_board, symbol):
   Выбор действия
    :param positions: возможные клетки, куда можно поставить символ
    :param current_board: состояние поля
    :param symbol: какой символ нужно поставить
    :return:
    # С заданной вероятностью действие случайное
   if random.random() <= self.exp_rate:</pre>
        action = random.choice(positions)
    else:
        action = [-1, -1]
        value_max = float('-inf')
        for p in positions:
            next_board = copy.deepcopy(current_board)
            next\_board[p[0]][p[1]] = symbol
            next_boardHash = getHash(next_board)
            if self.states_value.get(next_boardHash) is None:
                value = 0
            else:
                value = self.states_value.get(next_boardHash)
            if value >= value_max:
                value_max = value
                action = p
    return action
```

```
def feedReward(self, reward):
    """
    Oбновить значения для всех состояний, которые были в игре, в зависимости от её исхода
    :param reward: награда после игры
    """
    for state in reversed(self.states):
        if self.states_value.get(state) is None:
            self.states_value[state] = 0
        self.states_value[state] += self.lr * (self.decay_gamma*reward - self.states_value[state])
        reward = self.states_value[state]
```

ОБНОВЛЯЕМ ЗНАЧЕНИЕ ВСЕХ СОСТОЯНИЙ В ЗАВИСИМОСТИ ОТ НАГРАДЫ ПОКА ИГРА НЕ ЗАКОНЧЕНА- ДОСТАЕМ ВСЕ ПОЗИЦИИ, ИЗУЧАЕМ ВОЗМОЖНЫЕ СЛЕДУЮЩИЕ ХОДЫ, ПРОВЕРЯЕМ НА ЗАВЕРШЕНИЕ ИГРЫ И ВЫДАЕМ НАГРАДЫ, ОБНОВЛЯЕМ состояния и ОЧИЩАЕМ ДОСКУ. (ОДИНАКОВО ДЛЯ КРЕСТИКА И НОЛИКА)

```
def fit(self, rounds):
    for i in range(rounds):
        if i % 1000 == 0:
           print(f'Игра №{i}')
        while not self.isEnd:
            # Ход крестиков
           positions = getAvailablePositions(self.field)
            tic_cell = self.tic_player.chooseAction(positions, self.field, self.playerSymbol)
            # Обновляется состояние
            self.updateState(tic_cell)
            field_hash = getHash(self.field)
            self.tic_player.states.append(field_hash)
            # Определяем победил ли игрок
           win = self.checkWinner()
            if win is not None:
                # self.showBoard()
                # ended with tic_player either win or draw
                self.giveReward()
                self.tic_player.reset()
                self.tac_player.reset()
                self.reset()
                break
            else:
                # Ход ноликов
                positions = getAvailablePositions(self.field)
                tac_action = self.tac_player.chooseAction(positions, self.field, self.playerSymbol)
                self.updateState(tac_action)
                field_hash = getHash(self.field)
                self.tac_player.states.append(field_hash)
                # Победил ли игрок
                win = self.checkWinner()
                if win is not None:
                    self.giveReward()
                    self tic nlaver reset()
```

#### ИСТОЧНИКИ

1.REINFORCEMENT LEARNING — IMPLEMENT TICTACTOE

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3. HANDS ON INTRODUCTION TO REINFORCEMENT LEARNING IN PYTHON

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# СПАСИБО ЗА ВНИМАНИЕ!